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Users' ethical perceptions of social media research: Conceptualisation and measurement

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ABSTRACT

The study examines users' ethical perceptions of social media research focusing on the conceptualisation and development of a measure. We follow an established procedure using a mixed-method research approach to develop and validate a measure involving two studies. Five ethical dimensions are identified in study one, anonymity and ownership, exploitation, permission, vulnerable groups, and control. The dimensionality of the measure is validated in study two, while construct validity is tested. Overall, the findings of both studies indicate that the developed measure possesses good psychometric properties; thus, fully capturing ethical dimensions of social media research and offering significant theoretical and practical contributions. This line of research has implications for varied stakeholders, including social media analysts and organisations engaging in social media research practices.

1. Introduction

In March 2018, news emerged that Cambridge Analytica was involved in the collection of identifiable personal data from more than 87 million Facebook users, in order to influence voter views on behalf of politicians. This instance of social media research (SMR) was “grossly unethical” (Liptak, 2018), with Facebook losing £40 billion in market value in the space of a few hours of the scandal being announced (Kozłowska & Karaian, 2018) and recently fined \$5 billion (The Guardian, 2019). In light of the scandal, three million European users abandoned Facebook, and stories of high-profile businesspeople and celebrities (e.g., Elon Musk, Steve Wozniak, Cher) removing themselves from the platform emerged. For many organisations, Facebook and similar social media platforms are critical for reaching and communicating with target markets, therefore the prospect of losing access in those markets because of unethical SMR by the social media platform, or third parties, is a very real concern. However, while potential social media user backlash to the perceived unethical behaviour of Facebook and Cambridge Analytica may influence these organisations in different ways, the long term and cumulative impact of users' ethical perceptions of social media researchers' activities remains largely unclear (Le & Liaw, 2017; Martin, 2015).

Indeed, with every publicised data breach and each new ethical

scandal on social media platforms, it seems likely that user awareness of ethical problems will increase, and that greater focus will be placed on the ethical standards employed by those engaging in SMR and social media researchers themselves. However, one problem with current scholarly research on social media is that the research community has yet to identify the key bases upon which social media users and other stakeholders judge the ethics of the research undertaken on these platforms (Le & Liaw, 2017; Michaelidou & Micevski, 2019). Yet, until scholars have pinpointed the main ways in which users ethically evaluate the activities of social media researchers, the advances cannot be made in terms of understanding the downsides of unethical SMR or the potential benefits of being perceived as a strong ethical player by users/individuals.

Past research within related domains indicates that individuals' ethical evaluations of SMR may be complex, and multi-faceted (Ashworth & Free, 2006). We refer to SMR as involving the collection, storage and analysis of largely unremarkable social media data for various purposes by various stakeholders (e.g. market researchers, analysts and organisations, social media platforms), without users' knowledge and full disclosure of the data being collected, analysed and stored and by whom (Heath, Brooks, Cleaver, & Ireland, 2009). This practice raises varied concerns which threaten the ethical well-being of social media users, primarily with regard to information privacy,

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sensitive populations and medical information¹ (e.g. online health and/or sexual communities), as well as control over one's personal information (Hine, 2011; O'Brien, 2010; Sveningsson, 2004). The relevance of this research is self-evident and topical, given the growing awareness of the ethical dilemmas many businesses are facing in their interfaces with social media platforms. Additionally, the importance of this study is made greater by the fact that ethical issues in research are generally underrepresented in business and management domains (Bell & Bryman, 2007), with existing debates focusing on the issue of privacy/ethics in big data (e.g. Gleibs, 2014) and SMR practices, though without looking at the perspective of the users. This omission constitutes organisations and researchers that strive for the commercial value of big data, without the proper appreciation of the needs and perceptions of key stakeholders, such as the social media users, being seen as 'ignorant' (Nunan & Di Domenico, 2013).

With the above assertions in mind, this study is the first to investigate facets of users' ethical perceptions of SMR. To this end, we offer several theoretical and practical contributions. First, and from a theoretical point of view, we study SMR from an 'ethical' perspective, and develop an empirical understanding of the facets of users' ethical perceptions of SMR. This contribution is substantial and novel as, to date, a measurement tool that captures users' ethical perceptions of SMR is non-existent. Additionally, we contribute to knowledge by extending current work which examines the ethicality of general business and management activities, as well as specific SMR and analytics practices (e.g. Brunk, 2010; Michaelidou & Micevski, 2019). Second, in terms of practical utility, this study has implications for multiple stakeholders, including consumers who are social media users, market researchers and social media analysts, organisations, as well as the market research industry. Notably, understanding ethical perceptions of SMR assists in the development of an ethical climate surrounding the management and sustainability of SMR (e.g., providing insights to the development of ethical procedures in collecting 'live' social media data, as well as guidelines that take into consideration the interests of users as stakeholders). Moreover, such investigation will assist in building evidence-based strategies to cope with potential negative responses on social media, such as users' unwillingness to share information on social media platforms, or users abandoning social media in general.

The following sections discuss the relevant literature with regard to online marketing research ethics, followed by a description of the methodology, the analysis and the discussion of the findings. The paper concludes with a discussion of the theoretical contributions of the study.

2. Theoretical background

2.1. Ethics and research

Ethics are a longstanding issue in business and management research, with previous scholarly work attempting to review ethical theories to explain individuals' moral judgments, and ethical behaviour (Barraquier, 2011; Bell & Bryman, 2007; De Cremer, Van Dick, Tenbrunsel, Pillutla, & Murnighan, 2011; Treviño, Weaver, & Reynolds, 2006). For instance, Barraquier (2011) examines the determinants of ethical behaviour in organisations, stressing the experiential determinants grounded on moral philosophies and ethical standards, judgments and beliefs, that shape business practices. Similarly, Brunk (2010) focuses on perceived ethicality, which is argued to be a function of a number of different moral philosophies (Vitell, Singhapakdi, & Thomas, 2001), identifying spheres of corporate actions likely to elicit positive or negative ethical perceptions. Specifically, Brunk identifies six domains of organisational practices that are likely to trigger

consumers' ethical perceptions. These aforementioned works, as well as those of other authors (e.g., Bartlett, 2003), refer to moral philosophy underpinning theories of ethics and guiding business practices, including deontological and consequentialist approaches. Deontological philosophies argue that acts are seen as inherently right or wrong, just or unjust, and that, as opposed to teleology or consequentialism, the end does not justify the means (Bartlett, 2003; Mingers & Walsham, 2010). Adjunct to deontology is Kant's categorical imperative, which underlines the importance of actions to embed 'the concern for others'. Furthermore, this philosophy points out the importance of the duties and the expectations that individuals have in terms of being treated morally. Analogous to this, justice theory enacts the issue of fair treatment for moral reasons (Brebels, De Cremer, Van Dijke, & Van Hiel, 2011), in the procedures an organisation adopts (Culnan & Bies, 2003; Homans, 1961), positing that violations of fairness trigger ethical evaluations² which are said to lead to negative outcomes (Brunk, 2012; Culnan & Bies, 2003).

Previous work (e.g., Bell & Bryman, 2007) focuses specifically on management research practices, highlighting the importance of ethics. In particular, Bell and Bryman (2007) undertake a content analysis of ethics codes in social research, revealing a set of eleven ethical principles (e.g., privacy, informed consent, confidentiality, anonymity, reciprocity), the validity of which they challenge in terms of management research (Bell & Bryman, 2007). They argue that management research reflects a context in which diversity and specific considerations should be addressed, yet focuses on ethical issues as integral components. Of particular interest to our study is Bell and Bryman (2007) findings about 'covert' research, and the contention that it should be underpinned by ethical principles. More specifically, 'covert' or 'unobtrusive' research, while not so popular in offline environments, is a common practice on social media. This is due to organisations' efforts to extract and analyse information from social media in order to inform managerial decisions and to yield productivity and performance advantages (McAfee, Brynjolfsson, Davenport, Patil, & Barton, 2012). Though SMR appears to be morally-unchallenged, given the lack of scholarly works on users' perceptions of SMR, it involves important ethical challenges for multiple stakeholders (Mingers & Walsham, 2010), as everyone undertaking SMR may be compelled to engage in what some would call 'unethical behaviours' (De Cremer et al., 2011). For example, collecting information from social networking sites about employees, customers or other individuals without their knowledge and/or consent (Hine, 2011) given that this threatens users' privacy and exploits their personal data for commercial purposes (Castellacci & Tveito, 2018). Indeed, it can be argued that unobtrusive research threatens the ethical validity of SMR, as issues of privacy and control are particularly salient within this context (O'Brien, 2010) due to ambiguities connected to what is considered 'private' or 'public' in an online context (e.g., Kornblum & Marklein, 2006; Viégas, 2005). These contexts often overlap and, in most instances, are inseparable, thus making communication on social media available to the broader public (Cain & Fink, 2010). While some scholarly attention has been paid to the aforementioned issues, we focus our attention on investigating domains which trigger ethical challenges in SMR.

2.2. Online and social media research ethics

The previous literature on online marketing research has focused on ethical and normative issues (Hammersley & Traianou, 2011), with the focus being mainly directed on issues of privacy, control of information handling, public vs. private spaces, and informed consent (Buchanan &

¹ GRINDR – a "dating app" have been allowing 3rd parties to access user data, including users' HIV status (Singer, 2018).

² Ethical [as opposed to unethical] evaluations of actions and/or practices by individuals and organisations, are those that are perceived as fair and justifiable on the part of a larger community (Jones, 1991; Shalvi, Dana, Handgraaf, & Dreu, 2011).

Hvizdak, 2009; Moreno, Goniu, Moreno, & Diekema, 2013; Palmer, 2005; Weeden & Williams, 2012). Additionally, researchers have focused on discussing common regulatory considerations or security risks associated with social media, as well as its implications for underage social media users (e.g. Boyd & Crawford, 2012; Cain & Flink, 2010; Light & McGrath, 2010; Martin, 2015; McKee, 2013; Moreno et al., 2013; Nunan & Di Domenico, 2013). The following discussion provides an overview of the relevant ethics literature in this area.

Informational privacy refers to the “*claim of individuals, groups, or institutions to determine for themselves when, how, and to what extent information about them is communicated to others*” (Westin, 1967, p. 7). The concept has been extensively researched (e.g. Barnes, 2006; Brey, 2007; Hajli & Lin, 2016; Martin, 2015; Roman, 2007; Roman & Cuestas, 2008; Stead & Gilbert, 2001; Tavani, 2000), as individuals are concerned about the loss of their personal information to organisations in online settings (Tavani, 2000). Relative to offline environments, expectations and awareness about informational privacy in digital spaces are particularly complex and conflicting in nature (Acquisti & Gross, 2006; Boyd, 2010; Hugl, 2011; Solove, 2007). For example, there is evidence to suggest that privacy on social media is considered highly important (Acquisti & Gros, 2006; Hoadley, Xu, Lee, & Rosson, 2010) while, at the same time, users and particularly teen users, willingly share large amounts of personal information (Madden et al., 2013). Furthermore, privacy can be viewed from many perspectives (Barnes, 2006), with authors emphasizing the importance of the notions of the *control and autonomy* of users within the context of the Internet and social media, where agents are autonomous when it comes to controlling the sharing of their information (Gleibs, 2014; Hajli & Lin, 2016; Marturano, 2011; Stalder, 2011). According to Foxman and Kilcoyne (1993) informational privacy reflects one’s *awareness* about data collection practices (e.g. the processing of personal information, the observation of person’s behaviours and his/hers interface with others) as well as the degree of *control* over one’s information (also Gleibs, 2014; Schoeman, 1984). More specifically, awareness reflects the amount of information that an individual has about an organization’s privacy practices (Foxman & Kilcoyne, 1993). Awareness becomes salient in instances where an individual becomes (or intends to become) a user of an organisation’s services, and this is manifested through the provision of users’ agreements with an organization’s privacy terms and conditions (Foxman & Kilcoyne, 1993). Additionally, awareness is closely connected to an online media site, and whether or not users have read and agreed with the social media privacy terms and conditions. It is therefore not pertinent to covert research. On the contrary, control is manifested through approval, modification and the chance to opt-in or out (also Burgoon et al., 1989), and underpins unobtrusive research. In this case, there exists a complete absence of direct elicitation of data and the seeking of consent (Webb, Campbell, Schwartz & Sechrest, 1966), whereby online users do not play an active role in data gathering, nor are they given prior information about the data collection activities of the organisations using the data, nor being given the opportunity to withdraw their information from such practices. Within the context of social media, control addresses the level that individuals feel that social media allows them to have oversight over the use of information via privacy settings (Hajli & Lin, 2016). The authors argue that users need greater control of their personal information in order to ensure their privacy, while low levels of perceived control over information on social media platforms (e.g. Facebook) have been found to lead to negative outcomes on the part of consumers (Hoadley et al., 2010).

Furthermore, security is loosely related to the notion of privacy, and has been studied in relation to ethics (e.g. D’Arcy & Hovav, 2009; Roman, 2007). The concept refers to the protection of individual data by securing confidentiality (such as security from allowing third party’s to access, copy and disseminate personal information), and ensuring integrity and availability (Schoeman, 1992). Although security is an issue separate to privacy, the two concepts are frequently used interchangeably in the literature. This is because the core values of security

(e.g. protection from potential adverse effects of others’ behaviour) can be manifested or articulated via privacy (Schoeman, 1992). For example, the violation of data confidentiality might also breach a user’s privacy rights. Within the context of social media, Hajli and Lin (2016) argue that the concept of security has been ethically challenged with regard to the usage of consumers’ social media information for business purposes.

Concomitant to the above is the fact that online environments do not easily conform to the spatial configurations of public and private spaces, an aspect which is surrounded by ambiguity in the academic literature (Kornblum & Marklein, 2006; Viégas, 2005). Specifically, researchers argue that the boundaries between ‘public and private’ domains are drawn differently online relative to offline spaces (Koufaris, 2001; Waskul & Douglas, 1996), and they are often unclear when it comes to social media users (Barnes, 2006; Katz & Rice, 2002; Viégas, 2005). This includes underage users, who often willingly disclose private thoughts and behaviour which is then collected by marketers/organisations (Barnes, 2006). Previous research confirms that in online spaces users may frequently describe their public posts as being private (Kozinets, 1998). Given the blurring of private vs. public that exists in online spaces when conducting online market research [and social media analytics thereafter] (Barnes, 2004; Bruckman, 2004), scholars argue that anonymity cannot be ensured due to the existence of tracking and other devices (Porr & Ployhart, 2004). As such, these platforms provide social media analysts access to large amounts of unobtrusive personal information, online conversations (e.g. tweets) and behaviours that users think belong to them (Barnes, 2006; Gleibs, 2014; Markham, 2006). For example, Facebook users create profiles that provide information about themselves and their preferences and habits, which are then available to others given that they are posted on public spaces.

Last but not least, the protection of minors and other vulnerable groups (e.g. medical communities) in terms of their personal information being collected in online contexts, constitutes an ethical responsibility on the part of organisations and managers engaging in social media research (e.g., Hasnas, 1998; McKee, 2013). Social media are currently used as tools for disseminating public health information, with individuals frequently posting information about their medical conditions and seeking advice from others (De Choudhury, Gamon, Counts, & Horvitz, 2013). Similarly, adolescents are found to increasingly share information on social media compared with previously (Madden et al., 2013). Of particular concern is adolescents’ usage of social media, given that it is increasing, with over 50% of 13–17 year olds visiting a social media site at least daily (AACAP, 2018) and over 80% of adolescents posting pictures of themselves, their interests and birthdates (Madden et al., 2013). This raises ethical concerns about how information posted by such groups is used by social media analysts, and whether the best interest of these groups is directly or indirectly taken into consideration in terms of such practices. The protection of these vulnerable groups in terms of their personal information being collected in online contexts, reflects an ethical dimension with regard to SMR, and highlights the responsibility of organisations and managers engaging in such practice (e.g. Hasnas, 1998; McKee, 2013).

2.3. Users’ ethical perceptions of SMR: Defining the construct domain

In line with previous research in the area of business ethics (e.g. Roman, 2007) we define the domain of the construct of ethical perceptions of SMR as involving issues of *privacy, security, control, consent, private and public spaces, and vulnerable groups*. To further inform the definition of the domain of the construct, we conducted a review of the literature on the measurement of consumer ethical beliefs (e.g. Mitchell, Balabanis, Schlegelmilch, & Cornwell, 2009; Muncy & Vitell, 1992; Roman, 2007; Roman & Cuestas, 2008; Vitell & Muncy, 2005). Consumers form perceptions about the ethicality of certain actions (Brunk, 2010; Crane, 2001), and which reflect subjective judgments of

right or wrong or good or bad (Brunk & Bluemelhuber, 2011). Commonly, previous research has assessed the ethicality of specific behaviours or general business actions or practices, by assessing beliefs of righteousness or wrongness, thus capturing neutral or positively/negatively-valenced sentiments (Bartels, 1967; Brunk, 2010; Muncy & Vitell, 1992). Furthermore, to delineate the construct definition we also drew from existing research regarding the activities entailed in SMR including the collection, storage and subsequent analysis on unobtrusive social media data (Heath et al., 2009; Hajli & Lin, 2016; Michaelidou & Micevski, 2019). Based on the aforementioned, we define ethical perceptions of [unobtrusive] SMR in this study as reflecting: “individuals’ subjective beliefs of the righteousness/wrongness of SMR activities (e.g. collection, storage and analysis) by various stakeholders and for various purposes, and which raise issues of privacy, control, security, consent and anonymity”. This definition allowed us to initially establish the confines of the construct, and to develop an initial understanding of its facets (Hinkin, 1995). This approach in defining of the theoretical construct is in line with existing arguments on scale development procedures which indicate that constructs reflect general abstractions (Kerlinger, 1986). In this case, the theoretical phenomenon of interest is ‘users’ ethical perceptions of SMR’, without exemplifying specific purposes as to why the research is conducted and by whom, which interestingly, reflect specific instances of the concept of SMR (see Diamantopoulos, 2005). Given that individuals exhibit variation or asymmetry in terms of ethical perceptions as a result of possible tolerance (Brunk & Bluemelhuber, 2011; Cohn, 2010; Lauby, 2012), our definition of the domain of the construct was put to test in the subsequent stage of the research to ensure measurement adequacy and content validity (Hinkin, 1995).

3. Methods

Following established measure development procedures (Churchill, 1979), we conducted a series of focus groups to better understand the domain of the construct. These enabled us to capture what actions consumers see as questionable or ethical/unethical as part of SMR, and to ensure the measurement adequacy and content validity of the construct (Hinkin, 1995). Data was collected via four focus groups with a purposive sample of twenty-eight social media users. Participants included 36% males and 64% females, spread across the following age groups: 22% in the 18–24 age group, 54% between the ages of 25 and 34, 18% in the 34–44 age group, and finally 7% in the 45–54 and 55–65 age groups. The majority of respondents had an undergraduate-level education, while most participants were in employment, with 46% indicating an income of between £16 K and of up to £25. Our sample closely reflects current social media usage trends (e.g. Statista, 2019a), thus ensuring the sample representativeness.

Each focus group discussion lasted approximately one hour. Throughout the discussion process, a semi-structured discussion guide was followed, based on the a priori themes identified in the literature. More specifically, the discussion guide included questions about social media usage (What social media do you use? How often do you use SM? Do you follow brands on SM? Do you engage with brands on SM? (consume/contribute content), awareness of unobtrusive social media research, issues (if any) connected to this type of research, what concerns they have in relation to this type of research, and whether there are any (other) ethical concerns arising from these issues. These questions were kept general on purpose so not to lead our respondents. After discussing these general concerns, we also asked some more specific questions if we saw that one focus group was more elaborate than another (e.g. Do you think companies may be collecting your social media data/posts etc. without your knowledge and consent? Do you think that companies should be collecting social media information, including personal information? What ethical issues, if any, might arise from this practice companies may be engaging?).

All the transcripts were subsequently analysed using QSR NVivo,

Table 1

Ethical Perceptions of Social Media Research Pool of Items following Purification Stage.

1. Collecting information on social media (SM) users that users think is not visible to others
2. Collecting SM users’ information that users think belongs to them
3. Failing to keep the collected information on SM anonymous
4. Using collected SM information for research purposes
5. Using collected SM information for marketing purposes
6. Collecting information on SM without permission
7. Storing information collected on social media without permission
8. Using tracking devices to observe SM activity without valid consent
9. Selling collected SM information to third parties
10. Disclosing SM information to third parties without consent
11. Keeping the SM information for longer than needed
12. Collecting data from underage users
13. Collecting data from vulnerable groups (e.g. medical, sexual)
14. Neglecting to safeguard the information collected from SM users
15. Failing to allow users to have control over their information once collected
16. Denying users the right to choose if they wish their data to be collected
17. Neglecting to inform users that they will be the object of market research on SM
18. Failing to allow users to opt-out

where a thematic analytical process facilitated the identification and organisation of data resulting in codes and themes. Following this process, we were able to identify 23 items capturing five broad and salient themes (Crabtree & Miller, 1999). While the themes identified were consistent with key issues discussed in the literature (i.e. privacy, control, vulnerable groups, and consent), respondents also exhibited concerns about their data being sold to others (i.e. exploitation). This theme complemented the existing a priori topics identified in the literature, and was therefore included in the subsequent analyses. Furthermore, in order to address the issue of item purification and assessment of content validity (Kimberlin & Winterstein, 2008; Stone, 1978), four academic experts in the area of business ethics evaluated the items after being introduced to the main purpose of the study. Based on the experts’ assessment we: 1) collectively took the categorisations and provided an overall categorisation of items using the 5 dimensions, and 2) removed 5 items that indicated as ‘overlapping’ with others in the scale (Table 1).

4. Analysis and findings

4.1. Study 1

Data Collection and Analysis. The first stage of data collection involved the use of questionnaires involving a sample of consumers in the UK. The aim was to assess the 18 items identified at the purification stage. All 18 items were measured on a 7-point Likert-type scale assessing 1- righteousness or 7 - wrongness of social media research activities. Potential issues with regard to common method bias were controlled via two approaches for minimizing such biases: 1) procedural and 2) statistical remedies (Podsakoff, MacKenzie, Lee, & Podsakoff, 2003). In terms of the procedural remedies, several approaches were used. First, the questionnaire included different format scale anchors for ethical beliefs statements, outcome variables (used subsequently for testing the predictive validity of the measure) and demographic questions, to minimise the potential for common method bias (Dillman, 2006). To further minimise any threats of response bias, we made sure that the respondents were informed about the purposes of the study and were asked to agree with the terms and conditions they were provided with in the introduction to the research. They were also informed that all the information obtained would remain anonymous and that no personal data would be recorded at any point (Podsakoff et al., 2003). Furthermore, respondents were unable to proceed with the questionnaire if they were either under-aged (under 18) or did not formally agree to take part in the survey. Only those participants using social media were allowed to proceed with the survey. In total, 202

Table 2
Study1 descriptive statistics.

Non-student sample	n	Percentage %
Gender		
Male	76	37.6
Female	126	62.4
Age		
18–24	18	8.9
25–34	73	36.1
35–54	88	43.6
55 and over	23	11.4
Income		
Less than £10 000	13	6.4
£10 001 to £19 999	45	22.3
£20 000 to £29 999	57	28.2
£30 000 to £39 999	31	15.3
£40 000 and more	56	27.7
Social media usage		
1-less than 2 years	4	2.0
2-less than 3 years	10	5.0
3-less than 4 years	18	8.9
4-less than 5 years	17	8.4
5-less than 6 years	28	13.9
6-less than 7 years	16	7.9
7 years and longer	109	54.0
Time spent on social media weekly		
1–30 min	2	1.0
31–59 min	29	14.4
1–2 h	24	11.9
2.1–4 h	45	22.3
4.1–8 h	54	26.7
More than 8 h	48	23.8

fully completed questionnaires were obtained. Table 2 indicates the participants' demographic profile.

As a first step in the analysis, we examined the non-response bias. Having deemed it necessary to ensure the anonymity of our respondents and considering the relative sensitivity of the subject of the study, we were unable to identify the non-respondents and make inquiries about the reasons for their lack of response. Hence, we examined the non-response bias via the time trend extrapolation test where we compared the responses from the first and the last quartiles (Armstrong & Overton, 1977). No significant differences were identified, suggesting that non-response bias is not an issue in our data.

Exploratory Factor Analysis (EFA). The 18 items were subsequently subjected to EFA using Principal axis factoring with an Oblimin rotation. The KMO (0.917) and Bartlett's test ($\chi^2/df = 3088.533/153$; $p \leq 0.01$) both indicate suitability for factor analysis. The EFA returned a clean 5 factor solution with no-cross loadings (Table 3). All factor loadings exceeded the 0.4 threshold (Hair, Black, Babin, Anderson, & Tatham, 2010), with a 5-factor solution explaining 73.251% of variance. Hence, the findings of the EFA indicated a five-dimensional structure with regard to the participants' ethical perceptions of SMR, with the factors identified as follows, 1) *Anonymity and ownership*; 2) *Exploitation* 3) *Permission*; 4) *Vulnerable groups*; 5) *Control*.

The first factor - '*anonymity and ownership*' - relates to the level of visibility of the personal data that users provide online. This issue is particularly salient on social media where once data has been posted on social media, it can easily be traced back to the user. Hence, what might feel that a private exchange or sharing of information is actually available to the wider public (Barnes, 2006; Eysenbach & Till, 2001). Furthermore, '*exploitation*' (factor 2) has been pointed out as an important issue in organisational research (e.g. Chen, Chiang, & Storey, 2012; Hempel & Lehman, 2005; Zeng, Chen, Lusch, & Li, 2010). In the context of our research, the respondents believe that collecting and analysing individuals' data on social media that is subsequently used for marketing purposes is ethically questionable. This facet highlights the

exploitation of personal information, reflecting on the information commoditization practices by market researchers and companies, including selling the information they collect to third parties (Barnes, 2004). The third factor, namely '*permission*', tackles the issue of consented access to users' data, and is closely related to the issue of privacy. The respondents deemed it necessary for market researchers and social media analysts to clearly state the way (and ask for permission) in which data is collected, stored and transported (Garcia, Standlee, Bechkoff, & Cui, 2009; Sveningsson, 2004). Factor 4 ('*vulnerable groups*') addresses the ethicality of collecting data from minors and other vulnerable communities. Vulnerable users (e.g. medical patients) may not be utilizing the potential benefits offered by social media (e.g. an increase in social support, interconnectivity and awareness) (Idriss, Kvedar, & Watson, 2009) due to their perceptions about the lack of privacy and/or security on social media (e.g. dissemination of potentially erroneous, personal, health related information) (Eysenbach & Till, 2001). Finally, the fifth factor - '*control*' [over personal information] - is underpinned by informational privacy and security (Westin, 1967, p. 7). The literature on informational privacy construes control as instrumental to privacy protection, to the extent that certain definitions of privacy are actually reflected in one's control over one's personal information flow (e.g. Kang, 1998; Solove, 2007; Tavani & Moor, 2001). In this case, control is manifested in terms of social media users' control of their personal information and content (e.g. posts, pictures, etc.) highlighting the need for direct consideration or representation of users' interests in social media analytic practices by organisations, by seeking to obtain direct permission.

Confirmatory Factor Analysis (CFA). A five-factor model emerging from EFA was specified in the CFA in which the items were allocated to the subsequent sub-scales that were identified in the previous stage. This stage was purely confirmatory, as the aim of this study was to check the stability of the five-dimensional solution identified. The initial CFA results returned a mediocre model fit, with a $\chi^2(125) = 401.10$, NNFI = 0.96, CFI = 0.967, SRMR = 0.07 and RMSEA = 0.105. Given the issue with the RMSEA value being higher than the recommended ≤ 0.08 threshold (Bagozzi & Yi, 2012) and considering that it is not uncommon in CFA model assessment for the implied model not to fit the observed data well on first estimation (Kelloway, 1998), we undertook further trimming of the scales. Accordingly, through an iterative process in which we identified items with highly correlated errors and low correlation among them, those items that performed poorly (5 items) were deleted from the model (Anderson & Gerbing, 1988). Consequently, our final measurement model produced a good fit as all indicators performed within the recommended benchmark levels ($\chi^2(55) = 111.02$, NNFI = 0.977, CFI = 0.984, SRMR = 0.032 and RMSEA = 0.07) (Bagozzi & Yi, 2012).

Reliability and Validity Assessment. To determine the scale reliability, coefficient alpha was calculated for each subscale identified through the CFA. Reliabilities exceeded the preferred level of 0.7 (Churchill, 1979) and ranged from 0.776 for "Exploitation" to 0.937 for "Observing vulnerable groups". These reliabilities are also above the Nunnally (1978) suggested value of alpha of 0.5 or 0.6 at the early stages of research. To further evaluate the internal consistency of the scales, we computed composite reliability (CR) estimates and average variance (AVE) extracted estimates. The CR estimates ranged from 0.792 to 0.939 which are above the recommended threshold of 0.6 (Fornell & Larcker, 1981) (Table 7). The results for the AVE estimates also exceeded the advocated level of 0.5 (Fornell & Larcker, 1981). In addition, inter-items correlations indicate a strong internal consistency with regard to all the dimensions of the scale, with all the items belonging to their corresponding sub-dimension correlating strongly and meeting the minimum recommended threshold value of 0.35 (Hair et al., 2010). Finally, with regard to the nature of individual parameters and the model's internal structure, item loadings on their corresponding dimensions are all greater than the recommended 0.6 cut-off point (Bagozzi & Yi, 1988). T-values for the loading are all highly significant

Table 3
EFA Five Factor Solution.

Items:	Factors in EFA*				
	1	2	3	4	5
1. Collecting information on social media (SM) users that users think is not visible to others	-0.847				
2. Collecting SM users' information that users think belongs to them	-0.745				
3. Failing to keep the collected information on SM anonymous [#]	-0.560				
4. Using collected SM information for research purposes		0.836			
5. Using collected SM information for marketing purposes		0.690			
6. Collecting information on SM without permission			-0.568		
7. Storing information collected on social media without permission			-0.692		
8. Using tracking devices to observe SM activity without valid consent [#]			-0.821		
9. Selling collected SM information to third parties [#]			-0.597		
10. Disclosing SM information to third parties without consent			-0.789		
11. Keeping the SM information for longer than needed [#]			-0.419		
12. Collecting data from underage users				0.966	
13. Collecting data from vulnerable groups (e.g. medical, sexual)				0.927	
14. Neglecting to safeguard the information collected from SM users [#]					0.484
15. Failing to allow users to have control over their information once collected					0.623
16. Denying users the right to choose if they wish their data to be collected					0.865
17. Neglecting to inform users that they will be the object of market research on SM					0.848
18. Failing to allow users to opt out					0.801

Note: * Factors: 1 – anonymity and ownership; 2 – exploitation; 3 – permission; 4 – vulnerable groups; 5- control.

[#] items dropped at a later stage of analysis.

Table 4
Correlations and Discriminant Validity of the Constructs (Study 1).

	1	2	3	4	5
1. Anonymity and Ownership	0.81	0.30	0.40	0.16	0.43
2. Exploitation	0.55	0.66	0.27	0.14	0.20
3. Permission	0.63	0.52	0.79	0.16	0.70
4. Vulnerable Groups	0.40	0.38	0.40	0.89	0.15
5. Control	0.66	0.45	0.84	0.39	0.76

Note: Correlations are below diagonal, squared correlations are above the diagonal, and AVE estimates are presented on the diagonal.

($p \leq 0.01$) and range from 6.49 to 12.13. Taken collectively, Cronbach's Alpha estimates, composite reliability, average variance extracted, item-to-total correlations and item loadings all provided support for the reliability of the dimensions. Furthermore, we assessed convergent and discriminant validity; all AVE values exceed the recommended threshold of 0.5, and all AVE estimates for each of the constructs is greater than the squared correlation estimate for each pair of constructs (Fornell & Larcker, 1981) (see Table 4). Hence, we conclude that the five factors meet the standard requirements for demonstrating discriminant validity.

Following the reliability and validity assessments, we undertook an additional step in validating the five-factor solution, and tested it against a four-factor solution. The choice of a four-factor solution was based on combining the two highest correlated factors, i.e. factor 3 (Permission) and factor 5 (Control). By comparing the fit indices, it is obvious that the five-factor solution fits the data significantly better ($\chi^2(59) = 245.048$, NNFI = 0.94, CFI = 0.956, SRMR = 0.04 and RMSEA = 0.125; $\Delta\chi^2(\Delta df) = 135.043(4)$ ($p \leq 0.01$)). Consequently, these results demonstrate further the appropriateness of a five-factor solution.

Common Method Variance (CMV) Tests. Apart from using procedural remedies to tackle the potential issue of CMV (as describe earlier) we also employed statistical remedies (Podsakoff et al., 2003). To statistically test for CMV, we first performed the Harman's single-factor test (Podsakoff et al., 2003), as one of the most widely used tools for assessing the potential issues associated with common method bias. No single factor was uncovered which indicated that CMV was not a threat, the CMV single factor model fit is poor ($\chi^2(65) = 629.76$, NNFI = 0.804, CFI = 0.837, SRMR = 0.113 and RMSEA = 0.208), and the improvement in the model fit on moving from the CMV single factor

model to the five-factor model is significant ($\Delta\chi^2(\Delta df) = 519.71(10)$ ($p \leq 0.01$)). However, as this method is not without its limitations, we added rigour to our CMV assessment by adding the additional marker variable test (Lindell & Whitney, 2001). We used the item "How often do you play sports?" as a marker variable which, from a conceptual point of view, was unrelated to the constructs analyzed in our model. We performed a partial correlation analysis among the items measuring our constructs, and assessed whether or not the significance of the zero-order correlations changed when the marker variable was partialled out. The significance of the resulting coefficients did not change, suggesting that CMV was not a problem in the analysis. Together, these two tests lead to the conclusion that CMV does not pose a threat for Study 1.

4.2. Study 2

In the second stage of the research, we aimed to test the validity of the measure. To achieve this objective, we collected data from a new sample, in this case a sample of UK students. Student samples represent homogenous convenient samples with the ability to provide required information on the covariances between the items in the item pool (e.g. Koschate-Fischer, Diamantopoulos, & Oldenkotte, 2012; Sternthal, Tybout, & Calder, 1994). Additionally, student samples are widely used in academic research (e.g. Riefler & Diamantopoulos, 2009). With regard to this study, students reflect a segment constituted of active social media users, spending at least 6 h per day on social media sites (E-Marketer, 2015). In total, 238 responses were received. In terms of demographics, 47.5% were male and 52.5% female; 85% of them being between the ages of 18 and 24; and 68% having used social media tools for at least 6 years.

Similar to Study 1, we tested for non-response bias via a time trend extrapolation test and no significant differences were identified, suggesting that non-response bias is not an issue in our data. Next, similar to Study 1, we assessed CMV via Harman's single factor test and marker variable test, both of which showed that CMV was not an issue, the CMV single factor model fit is poor ($\chi^2(65) = 568.75$; NNFI = 0.825; CFI = 0.854; SRMR = 0.165 and RMSEA = 0.181), and the improvement in model fit on moving from the CMV single factor model to the five-factor model is significant ($\Delta\chi^2(\Delta df) = 460.79(10)$ ($p \leq 0.01$)). We again performed a partial correlation analysis among the items measuring our constructs and assessed whether or not the significance of the zero-order correlations changed when the marker

variable was partialled out. The significance of the resulting coefficients did not change, suggesting that CMV was not a problem in the analysis of Study 2.

Furthermore, following the results of Study 1, thirteen items were kept for further examination with a pre-specified five-factor model, and were entered into a confirmatory factor analysis (CFA) using the maximum likelihood estimation procedure, covariance matrix as input data implemented in LISREL 8.71. The measurement model produced a very good fit as all indicators performed within the recommended benchmark levels ($\chi^2(55) = 107.96$, NNFI = 0.981, CFI = 0.987, SRMR = 0.04 and RMSEA = 0.06) (Bagozzi & Yi, 2012). To determine the scale reliability, coefficient alpha was again calculated for each subscale identified through the CFA. Reliabilities exceeded the preferred level of 0.7 (Churchill, 1979) and ranged from 0.8 for ‘anonymity and ownership’ to 0.914 for ‘Control’. Further examination of the CR and AVE values also shows that they are all above the recommended thresholds (0.60 for CR and 0.50 for AVE) (Bagozzi & Yi, 1988; Nunnally, 1978). Moreover, we tested for discriminant validity by comparing all AVE values with the square of the correlations between each pair of constructs (Fornell & Larcker, 1981) and provided a proof for the discriminant validity between the constructs (all AVE values are greater than the square of the correlations between each pair of latent constructs; see Table 5, Study 2). Table 6 provides a full list of the items for the five dimensions of ethical perceptions of SMR for Studies 1 and 2, each item’s respective factor loading, and the descriptive statistics, Cronbach’s α , CR and AVE values for each of the measures. We again tested for the difference in fit between the four- and five- factor solution, and the results re-confirm the superiority of a five-factor solution, ($\chi^2(59) = 342.32$; NNFI = 0.931; CFI = 0.948; SRMR = 0.063 and RMSEA = 0.142; $\Delta\chi^2(\Delta df) = 234.36(4)$ ($p \leq 0.01$)).

4.3. Nomological and predictive validity

To ascertain the nomological aspect of construct validity, the five dimensions were correlated with ‘ethical research standards’ of social media researchers (SMRs) as well as general perceptions of the (un) ethicality of SMR (Cadogan, Lee, Tarkiainen, & Sundqvist, 2009; Peter, 1981). Ethical research standards of SMRs set the norms for ethical behaviour and inform the decisions on what is the right thing to do (or what is the right behaviour) and what is not (Hunt, Wood, & Chonko, 1989). As a result, the SMR ethical perceptions scale is expected to be positively related to the perceptions of the ethical research standards of SMRs, as well as the overall perceptions of the ethicality of SMR. As anticipated, all relationships were found to be positive and significant at $p \leq 0.05$ (Table 7). Furthermore, to determine the predictive validity, the SMR ethics facets were correlated with a set of conceptually-related variables. Previous research provides ample support for the impact of ethical beliefs on consumers’ retaliatory intentions or actions, such as boycotting (Brunk, 2010; Cohn, 2010; Hoadley et al., 2010). Predictive validity was assessed via the refusal to share/provide personal information on social media platforms and the falsification of information on social media platforms (Table 8) (e.g. Malhotra, Kim, & Agarwal, 2004; Sayre & Horne, 2000; Schoenbachler & Gordon, 2002).

Table 5
Correlations and Discriminant Validity of the Constructs (Study 2).

	1	2	3	4	5
1. Anonymity and Ownership	0.67	0.14	0.40	0.13	0.39
2. Exploitation	0.37	0.75	0.12	0.12	0.11
3. Permission	0.63	0.35	0.73	0.20	0.71
4. Vulnerable Groups	0.36	0.35	0.45	0.82	0.30
5. Control	0.62	0.33	0.84	0.55	0.73

Note, Correlations are below diagonal, squared correlations are above the diagonal, and AVE estimates are presented on the diagonal.

Note: St. 1 – Study 1; St. 2 – Study 2.

Additionally, concern for personal information has been closely linked to users’ control of their information in online settings (Awad & Krishnan, 2006) and data ownership (Hoffman, Novak, & Peralta, 1999). Consumers who perceive that collecting consumers’ data on social media is unethical will likely exhibit higher levels of concern on how the collected data might be used by the researchers. Finally, the falsification of, and refusal to provide, information on social media reflect two common strategies users frequently use to protect their privacy (Lampe, Ellison, & Steinfield, 2008; Lenhart & Madden, 2007). As can be seen from Table 8, all anticipated linkages were significant at $p \leq 0.05$, providing strong support for the nomological and predictive validity of the measures.

5. Discussion and implications

5.1. Theoretical implications

Prior work on ethical perceptions with regard to SMR from the point of view of users does not exist. Our study is original, and shows that there are five facets of ethical perceptions of SMR: anonymity and ownership, exploitation, permission, vulnerable groups, and control. Our results expand previous work on the ethics underpinning management research (Bell & Bryman, 2007), by first identifying ethical facets which corroborate previously identified ethical principles such as privacy and anonymity. Second, and more important, we bring to light key issues such as the commercial exploitation of data collected via SMR, which reflects a business reality in the private sector (Malomo & Sena, 2017), and also the issue of collecting information from vulnerable groups. Additionally, we confirm that individuals do not perceive the ethics of SMR invariably. Instead, there is asymmetry in ethical perceptions of SMR; as we find that although all mean values of constructs are significantly above the scale mid-point, users perceive lack of permission, anonymity and control as more unethical than exploitation (mean values of 4.49 and 3.66 for Study 1 and Study 2 respectively) and data collection from vulnerable groups (mean values of 5.19 and 4.92 for Study 1 and Study 2 respectively). There are two explanations for this: first, individuals see indirect, less immediate harm in some management actions (e.g., ‘denial of injury’, Strutton, Vitell, & Pelton, 1994), which in our study would be that collecting data from such groups on social media is perceived as being less unethical, and outside of our respondents’ direct harm or interest. Second, individuals exhibit a level of tolerance towards SMR because they enjoy a range of benefits from social media usage (e.g., economic, communication, self-expression). Also, we find that social media users won’t mind if their data is collected. Rather, it is their inability to be directly represented within this process as major stakeholders (e.g., to have control), that forms stronger ethical perceptions, and is seen as being most unethical. This notion is in line with business ethics theory (Freeman & Phillips, 2002) which highlights the responsibility of organisations to acknowledge that social media users are major stakeholders in social media analytic practices, and to consider their interests. Additionally, the findings are in accordance with previous work on ethical beliefs, suggesting that different dimensions of ethical beliefs will have a differentiating level of acceptability (Vitell & Muncy, 1992).

Another important finding of our study is that ethical perceptions with regard to SMR lead to specific actions, such as refusal to provide information on social media and the falsification of information. These actions are resonant with previous work in the domain of ethics that emphasise individual responses as a result of perceived unethicality of management or corporate practices (Brunk & Bluemelhuber, 2011). We provide evidence in this study that such actions are equally relevant for SMR in that they are perceived as unethical by social media users.

5.2. Managerial considerations

SMR represents a great opportunity for organisations to capitalize

Table 6
Constructs used in the study and factor loadings, 1(low)-7 (high).

Scale	Anonymity and ownership		Exploitation		Permission		Vulnerable groups		Control	
	St.1	St.2	St.1	St.2	St.1	St.2	St.1	St.2	St.1	St.2
Items:										
Collecting information on social media (SM) users that users think is not visible to others	0.889	0.817								
Collecting SM users' information that users think belongs to them	0.905	0.817								
Using collected SM information for research purposes			0.691	0.864						
Using collected SM information for marketing purposes			0.918	0.864						
Collecting information on social media without permission					0.925	0.873				
Storing information collected on social media without permission					0.921	0.921	0.889			
Disclosing of SM information to third parties without consent					0.817	0.817	0.792			
Collecting data from underage users							0.895	0.906		
Collecting data from vulnerable groups (e.g. medical, sexual)							0.985	0.985	0.906	
Failing to allow users to have control over their information once collected							0.773	0.829		
Denying users the right to choose if they wish their data to be collected										0.901 0.885
Neglecting to inform users that they will be the object of market research on SM										0.920 0.884
Failing to allow users to opt-out										0.888 0.812
Mean	5.93	5.4	4.49	3.66	6.26	5.8	5.19	4.92	6.16	5.67
Standard Deviation	1.42	1.37	1.64	1.47	1.32	1.48	1.84	1.73	1.27	1.32
Cronbach's α	0.891	0.8	0.776	0.854	0.912	0.887	0.937	0.902	0.925	0.914
Composite Reliability	0.892	0.801	0.792	0.855	0.919	0.888	0.939	0.902	0.927	0.914
Average Variance Extracted	0.81	0.67	0.66	0.75	0.79	0.73	0.89	0.82	0.76	0.73
Model fit statistics,	χ^2	df	X2/df		NNFI	CFI	SRMR		RMSEA	
Study 1	111.02	55	2.00		0.977	0.984	0.032		0.07	
Study 2	107.96	55	1.96		0.981	0.987	0.04		0.06	

on improving their decision making. Given its covert nature, SMR is also a context in which unethical actions can easily happen. Understanding how individuals perceive SMR is important for the ethical management of SMR and its reputation as an organisational practice. Thus, collecting information on platforms such as Facebook without the knowledge and consent of users, with the view to inform business decisions/strategies, can lead to high profile corporate scandals with political dimensions, as evident by the Cambridge Analytica/Facebook incident.

In this study, we delineated ethical perceptions of SMR and provide support to previous normative approaches in the sphere of the ethics of management research. On the basis of our results we present a number of interesting managerial reflections in areas where future research discussion might be fruitful. For example, are there benefits to greater cooperation or partnership between the social media platform and organisations engaging in SMR (e.g., private or public organisations) in order to adopt standards to safeguard the long-term viability of social media as data-driven decision-informing tools? Issues like permission, consent, and exploitation of data need to be integral in the ethical usage of such platforms when it comes to decision making. We therefore suggest the need for research into the benefits of different format 'consent pages', and measures to consistently ensure the age eligibility of social media users. Different procedures for seeking permission for the use of personal data should be evaluated to assess the value of social

media users being directly involved in SMR practices (e.g. reciprocity). For instance, how would users react to explicit warning messages on social media platforms that inform them that their data (e.g., posts, messages, pictures, etc.) may be collected and analyzed for business and marketing purposes? Currently, social media users agree to terms and conditions of usage on specific platforms. However, they have no control of their data and how it may be subsequently used. Would users react negatively (ethical perceptions/use behaviour) to warning messages, and would negative responses be short-lived?

Furthermore, other considerations stemming from our research may relate to alternative business models that enhance users' control of their information and alleviate transparency. For example, how would social media users respond to optional usage fees that would ensure part or total exclusion of their data from SMR? This ground-breaking reflection regarding social media usage fees has the potential to shape current agreements/partnerships that organisations (e.g., private/ public/ market research firms) currently have with the social media platforms, as well as to improve the ethical perceptions of SMR as a managerial practice. Organisations may also reflect on other ways to improve users' ethical perceptions of SMR. For instance, would improving transparency with regard to SMR (e.g. disclosure of the reasons why the data is collected, procedures of data extraction, usage, storage, and management), change users' ethical perceptions of SMR? Finally, we suggest that organisations look into whether offering assurances to users about

Table 7
Nomological validity.

	1	2	3	4	5	6	7	8
1. Anonymity and Ownership	1							
2. Exploitation	0.412**	1						
3. Permission	0.567**	0.382**	1					
4. Vulnerable Groups	0.344**	0.331**	0.394**	1				
5. Control	0.581**	0.369**	0.780**	0.440**	1			
6. Unethicality of social media research ^a	0.757**	0.673**	0.811**	0.700**	0.822**	1		
7. Social media researchers' ethical standards ^b	-0.193**	-0.230**	-0.126**	-0.254**	-0.156**	-0.262**	1	
8. The unethicality of SM researchers' actions	0.126**	0.156**	0.140**	0.439**	0.169**	0.290**	-0.205**	1

** Correlation is significant at the 0.01 level (2-tailed).

^a Item: Social media research is unethical (7=true).

^b Item: The ethical standards of social media researchers are very high (7=high).

Table 8
Predictive validity.

	1	2	3	4	5	6	7	8
1. Anonymity and Ownership	1							
2. Exploitation	0.412**	1						
3. Permission	0.567**	0.382**	1					
4. Vulnerable Groups	0.344**	0.331**	0.394**	1				
5. Control	0.581**	0.369**	0.780**	0.440**	1			
6. Information falsification	0.095*	0.149**	0.184**	0.095*	0.130**	1		
7. Information sharing refusal	0.259**	0.229**	0.198**	0.117*	0.164**	0.300**	1	
8. Concern for information misuse	0.139**	0.249**	0.228**	0.114*	0.184**	0.311**	0.677**	1

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

ethical principles of anonymity, confidentiality and security, might be a way to tackle SMR ethical perceptions.

6. Conclusions, limitations and future research

Collecting consumers' personal information via social media platforms has become a popular method for market researchers and social media analysts due to its relative simplicity and cost-effectiveness (Acquisti & Gross, 2006). The very nature of social media as a social communication tool encourages users to provide and exchange personal and even sensitive information which may easily become the target of researchers (Boyd, 2010). Many studies have pointed out the privacy and legal aspects connected to these practices, yet the ethical side of such activity has remained largely underdeveloped. This research set out to investigate users' ethical perceptions of SMR. We employed a deductive scale development procedure using mixed methods (Hinkin, 1995) and conducted two quantitative studies to develop and validate a measure capturing the ethical perceptions of SMR. We uncovered five facets in the form of *anonymity and ownership*, *exploitation [of personal information]*, *permission*, *vulnerable groups*, and *control [over personal information]* which significantly affect consumers' refusal to share information and the falsification of information on social media. The identification of the facets of SMR ethics has both theoretical and practical implications. However, as with any other study in the domain of measure development, further validation may be necessary. Although the development process involved several stages in order to ensure construct validity (e.g. in determining predictive validity we controlled for certain internal conditions of the users such as negative past experiences with social media researchers), there might be other internal (e.g. users' personal characteristics) and external conditions (e.g. culture) that might affect consumers' ethical perceptions of SMR. In addition, distinguishing further among the type of information collected (e.g. personal data, opinions, photos) and the type of social media users (e.g. the privacy fundamentalists, Westin, 1991) might affect the ethical acceptability thresholds. Finally, although many social media platforms (e.g. Facebook and Twitter) share a set of core features, there are differences in the degree of presence across social media platforms (e.g. Kaplan & Haenlein, 2010). And while, for example, certain social media platforms are higher in self-disclosure levels than others (such as blogs), other sites might have higher levels of social presence (e.g. virtual social worlds) (Kaplan & Haenlein, 2010). Discriminating between different social media sites might uncover differences in users' opinions as to what is ethically acceptable and what is not, in terms of collecting information on specific social media platforms.

Furthermore, in this study we focused on users of social media research as they represent 67% of the UK population (Statista, 2019b). However, investigating ethical perceptions of SMR among non-users might lead us closer to the underlying reasons of not being part of or detaching oneself from social media, and will enhance the practical utility of the scale. Indeed, it might be that non-users (or previous users)

value certain dimensions of the scale more strongly than the other dimensions and differently to the evaluation of existing users. This would provide additional valuable information to practitioners on why users become non-users and why non-users never become users. As such we encourage scholars to validate this scale with a non-user social media sample.

Finally, to ascertain the nomological and predictive validity of our newly developed scale we correlated the scale with six variables which the literature suggested were related to aspects of social media researchers' ethicality – e.g. ethical standards of social media researchers or the intention to falsify private information on social media – and were measured using single item measures. Although current literature argues that the use of single item measures encourages the development of theoretically sophisticated models and permits stronger statistical control of potential confounders (Hayduk & Littvay, 2012), future research may consider capturing these concepts using multiple items. Similarly, two of our dimensions have been captured by using two items, namely, exploitation and vulnerable groups. Even though our replication study supports the reliability and the validity of the scale and shows no indication of scale applicability threats, future research is needed to further validate our scale and assess its stability over time and across cultures. This would help further establish the validity of this newly developed SMR ethical perceptions scale and potentially lead to its further refinement. It may well be that, in some instance, a measurement instrument, when applied to other populations and types of organisations, might actually tap into different constructs (Cowles & Crosby, 1986). Hence an additional question that remains is whether this scale is also applicable for tapping into ethical perceptions of SMR from the perspective of companies or social media analysts. Future research can examine whether managers see these ethical dimensions as salient, or whether managers' ethical perceptions of SMR differ to those of the social media users.

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